



Paris, 10 Mai 2022

Le carbone organique des sols agricoles : vers un suivi spatialisé satellitaire

Emmanuelle Vaudour

UMR ECOSYS, AgroParisTech

AgroParisTech



Département

MathNum

INRAE

ECOSYS



➤ Actions en cours et prévues en lien avec le CES
Théia CartoSols

« Développements sur la télédétection du
Carbone des sols »

Emmanuelle Vaudour (ECOSYS), Diego Urbina-Salazar (ECOSYS, Infosol), Dominique Arrouays, Anne Richer-de-Forges (Infosol), Nicolas Baghdadi (TETIS), Youssef Fouad, Didier Michot (SAS), Nicolas Delbart (LIED), Florent Levavasseur (ECOSYS), Liliane Bel (MIA), Eric Ceschia (CESBIO), Cécile Gomez (LISAH), Philippe Lagacherie (LISAH)

Le CES Theia “Cartographie Numérique des sols”



UMR ECOSYS

J.M. Gilliot, E. Vaudour



UMR SAS

Y. Fouad, B. Lemerrier, D. Michot, C. Walter



BRGM

G. Martelet



ONERA

X. Briottet



UR SOLS

H. Bourennane, J. Daroussin



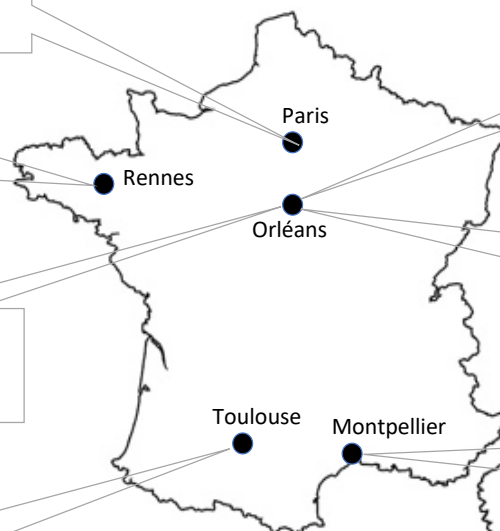
US INFOSOL

D. Arrouays, M. Martin, A. Richer-de-Forges, N. Saby



UMR LISAH

C. Gomez, P. Lagacherie



Travaux réalisés dans le cadre de financements

- TOSCA CES-theia CNS
- TOSCA PLEIADES-CO
- TOSCA POLYPHEME
- PNTS EUSOP
- ANR ATCHA
- ANR RUEdesSOLS

Objectifs

- ◆ Fédérer les efforts de recherche sur les verrous méthodologiques à lever (incubateur)
- ◆ Elaborer les produits *GlobalSoilMap* sur le territoire national et les territoires régionaux
- ◆ Organiser le transfert de compétence vers de nouveaux acteurs

POLYPHEME

Suivi spatialisé des pratiques d'amendement organique et du carbone Organique des sols agricoles au moyen des séries POLYPhasées sEntinel Multispectrales Et radar

De janvier 2020 à décembre 2022

Partenaires : INRAE (ECOSYS, MIA-Paris, Infosol, CESBIO, SAS), PRODIG

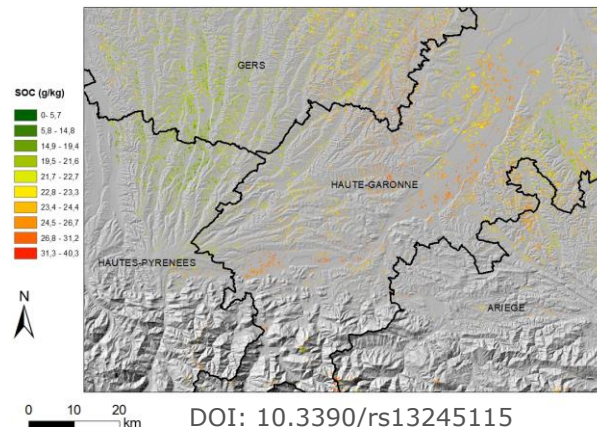
Axe 1 : modèles spectraux de prédiction des teneurs en Corg via S2

Axe 2 : modèles spectraux raffinés via S1 et S2 et modèles mixtes stats

Axe 3 : suivi des pratiques (cultures ; cultures intermédiaires ; épandages de MO) par télédétection et influence sur prédiction Corg

Axe 4 : influence de l'occupation du sol ancienne – séries rétrospectives

Financement TOSCA du CNES



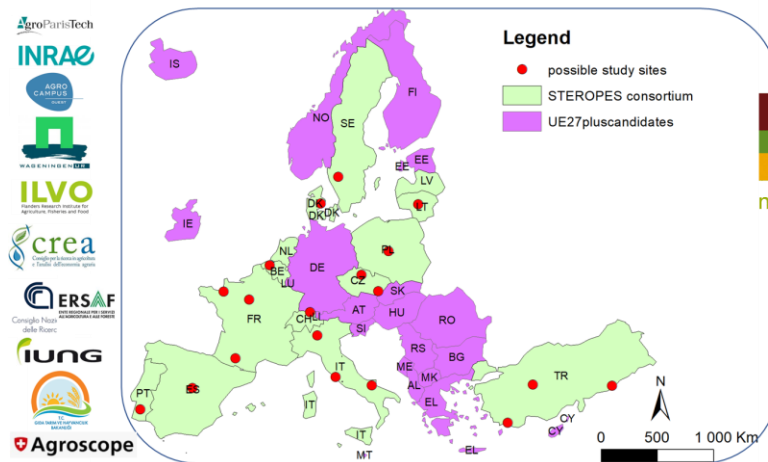
STEROPES 2021-2024 (EJP SOIL - H2020)

<https://ejpsoil.eu/soil-research/steropes/>



Stimulating novel Technologies from Earth Remote Observation to Predict European Soil carbon

Axes 1 – 2 (et 3 partiellement) de POLYPHEME, 14 pays
- débuté en février 2021

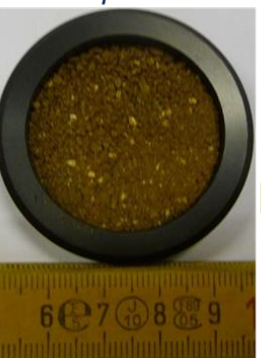


Overall background : from lab, field to image reflectance spectra

soil surface condition

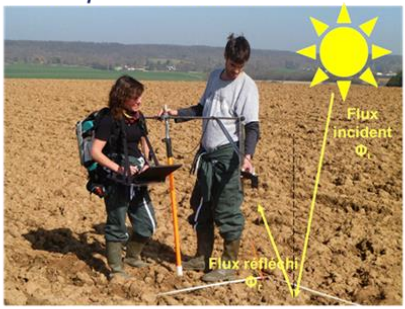


soil sample in the lab



lab chemical analysis

field spectral measurements



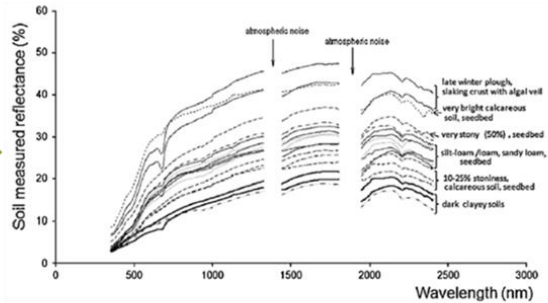
lab spectral measurements



doi:10.3390/s18041157



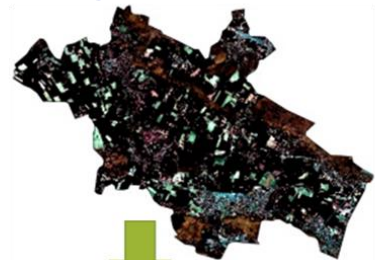
Barthès et al., 2008
Cécillon et al., 2009
Vaudour et al., 2018
Barthès and Chotte, 2020



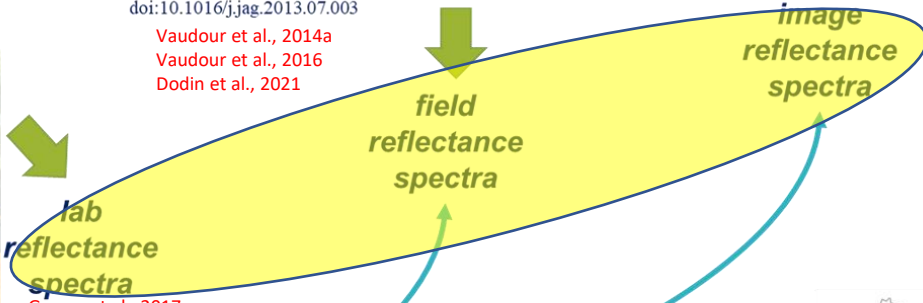
doi:10.1016/j.jag.2013.07.003

Vaudour et al., 2014a
Vaudour et al., 2016
Dodin et al., 2021

Image of bare soils

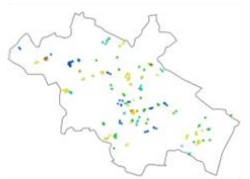


Gomez et al., 2012, 2019, 2022
Vaudour et al., 2013, 2014a, b, 2016, 2019a,b, 2021
Gilliot et al., 2017
Urbina-Salazar et al., 2021



spectral models
 $Property = f(R)$

spatial models
 $Property = f(x, y)$



sample locations
Zaouche et al., 2017
Mulder et al., 2016
Chen et al., 2019

Loiseau et al., 2019

Plan

1. Réflectance du sol en lien avec le carbone - jeux de données
2. Modèles spectraux de Corg issus d'images satellitaires
3. Caractérisation spectrale d'amendements organiques



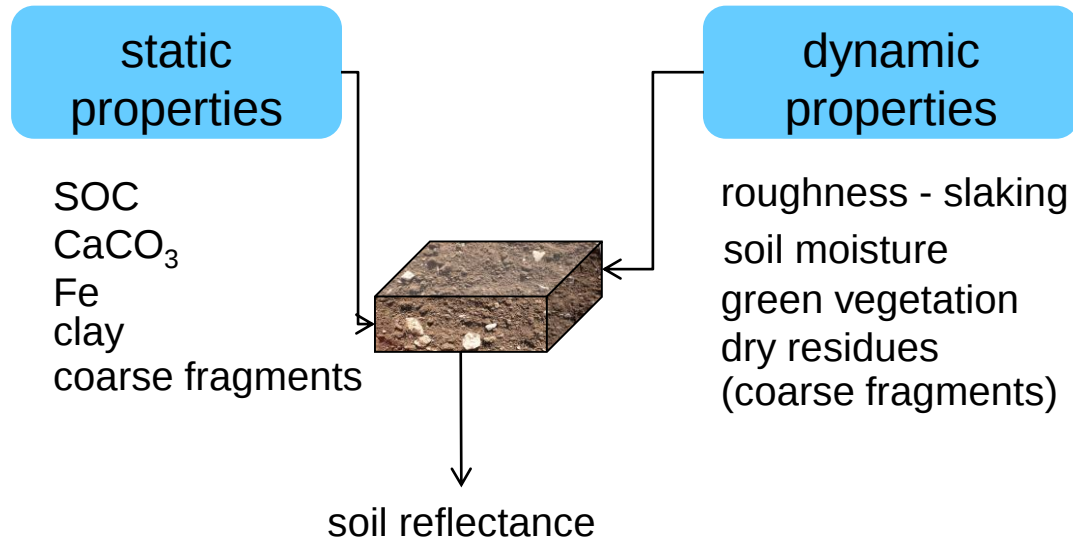
Main properties influencing bare soil reflectance

VAUDOUR E., GIRARD MC., 2010.
Pédologie, chapitre 23. In Girard
 MC & Girard CM, *Traitement des
 images de télédétection*, Dunod,
 Paris



©E. Vaudour – March 2012

*Soil surface condition « composition and
 organization of soil surface at a given time» -
 R. ESCADAFAL, 1989*





Mapping tillage operations over a peri-urban region using combined SPOT4 and ASAR/ENVISAT images

E. Vaudour^{a,b,*}, N. Baghdadi^c, J.M. Gilliot^{a,b}

^a AgroParisTech, UMR 1091 INRA/AgroParisTech "Environnement et Grandes Cultures", Equipe Sol, avenue Lucien Brégnière, F-78850 Thiverval-Grignon, France
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International Journal of Applied Earth Observation and Geoinformation 26 (2014) 217–234



Uncertainty of soil reflectance retrieval from SPOT and RapidEye multispectral satellite images using a per-pixel bootstrapped empirical line atmospheric correction over an agricultural region

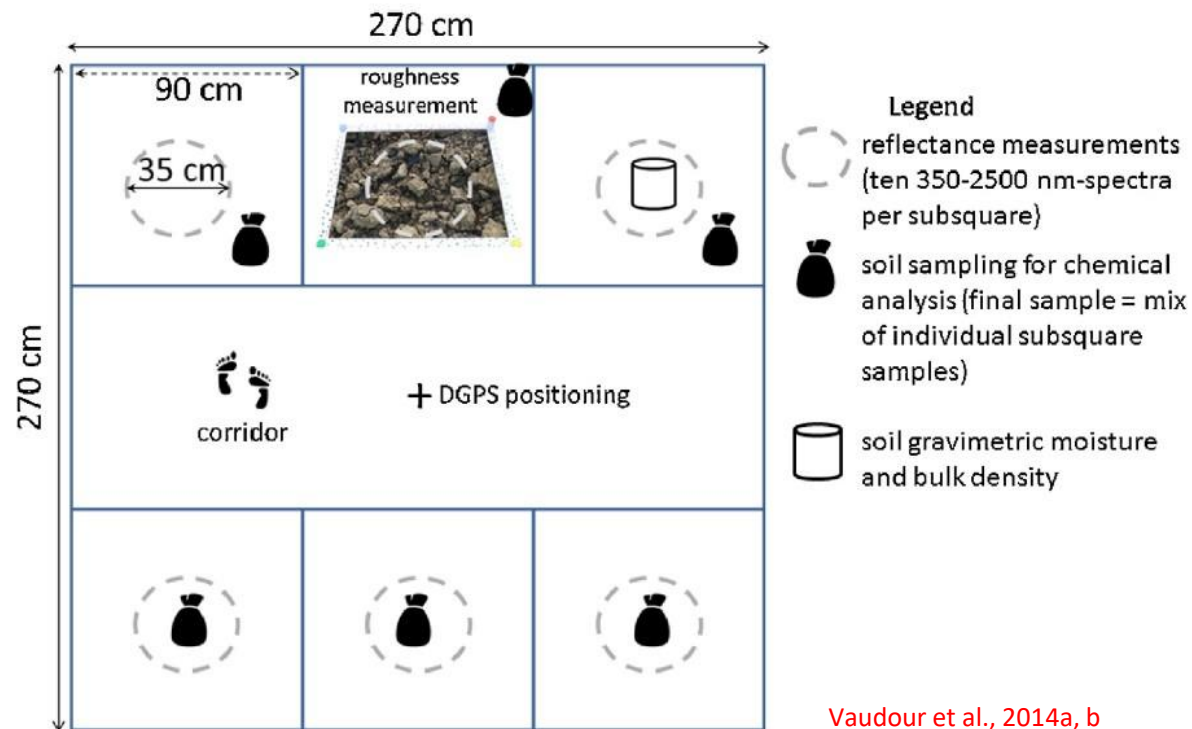
E. Vaudour^{a,b,*}, J.M. Gilliot^{a,b}, L. Bel^{c,d}, L. Bréchet^{b,a}, J. Hamiache^{c,d},
D. Hadjar^{b,a}, Y. Lemonnier^{b,a}

^a AgroParisTech, UMR 1091 INRA/AgroParisTech "Environnement et Grandes Cultures", Equipe Sol, avenue Lucien Brégnière, F-78850 Thiverval-Grignon, France
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^d INRA, UMR 518 MIA, 16, rue Claude Bernard, F-75231 Paris cedex 05, France



©UMR EGC-Equipe Sol, cliché E. Vaudour, mars 2012

Field reflectance measurements



Vaudour et al., 2014a, b



Original papers

Soil surface roughness measurement: A new fully automatic photogrammetric approach applied to agricultural bare fields

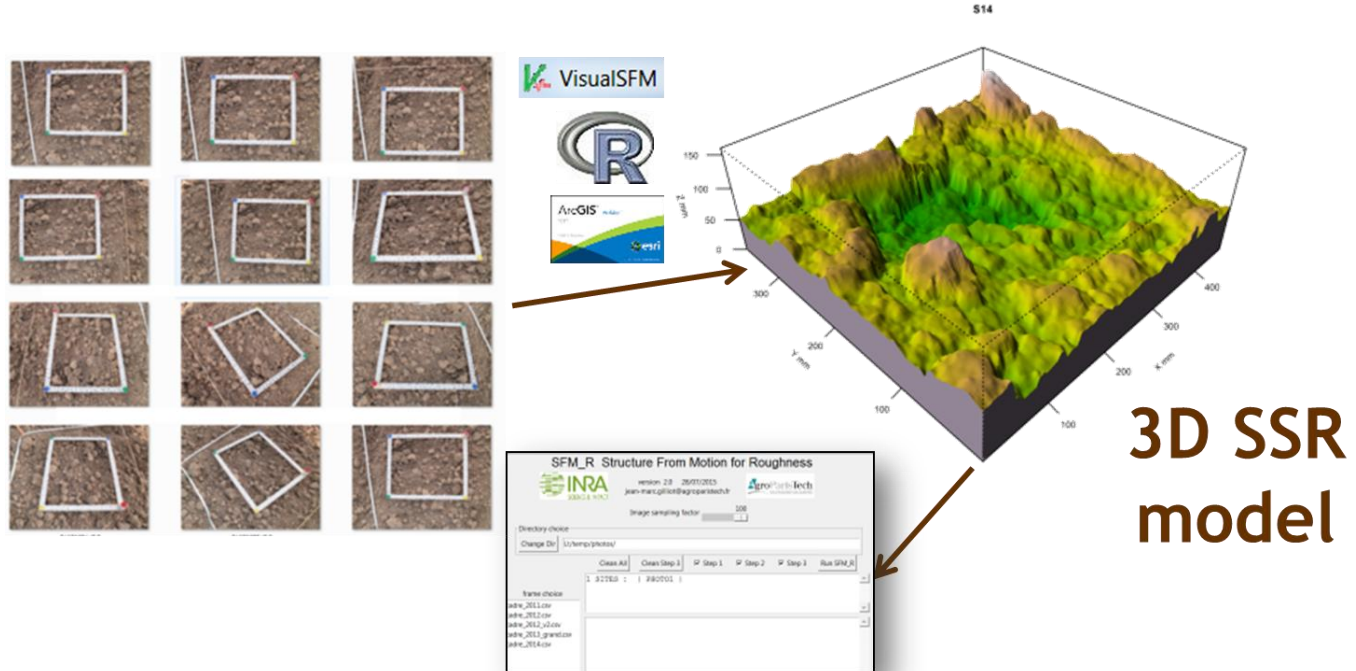
J.M. Gilliot *, E. Vaudour, J. Michelin

UMR ECOSYS, INRA, AgroParisTech, Université Paris-Saclay, 78850 Thiverval-Grignon, France



Soil surface roughness estimation : a 3D photogrammetric approach based on Visual SFM

Gilliot et al., 2017

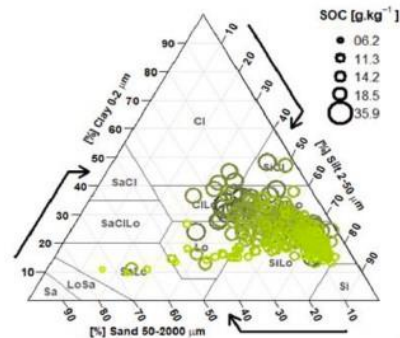




Dataset “Plaine de Versailles”

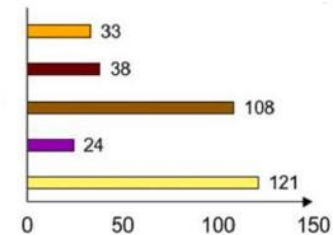
Temporal mosaicking approaches of Sentinel-2 images for extending topsoil organic carbon content mapping in croplands

Emmanuelle Vaudour^{a,*}, Cécile Gomez^{b,c}, Philippe Lagacherie^b, Thomas Loiseau^d,
Nicolas Baghdadi^e, Diego Urbina-Salazar^a, Benjamin Loubet^a, Dominique Arrouays^d



SOILSCAPE UNITS

- technosols or urban areas
- colluvic cambisols (stagnic) and fluvisols
- haplic and glossic luvisols
- haplic and truncated luvisols or cutanic cambisols
- podzolic cambisols and arenic colluvic cambisols
- calcaric, rendzic cambisols and colluvic calcaric cambisols
- water





Regional prediction of soil organic carbon content over temperate croplands using visible near-infrared airborne hyperspectral imagery and synchronous field spectra

E. Vaudour^{a,*}, J.M. Gilliot^a, L. Bel^b, J. Lefevre^c, K. Chehdi^c

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^c Université de Rennes 1/IETR UMR CNRS 63164, ENSSAT/TS2M, 6 rue de Kérampont, B.P. 80518, F-22305 Lannion cedex, France

cal-val approach

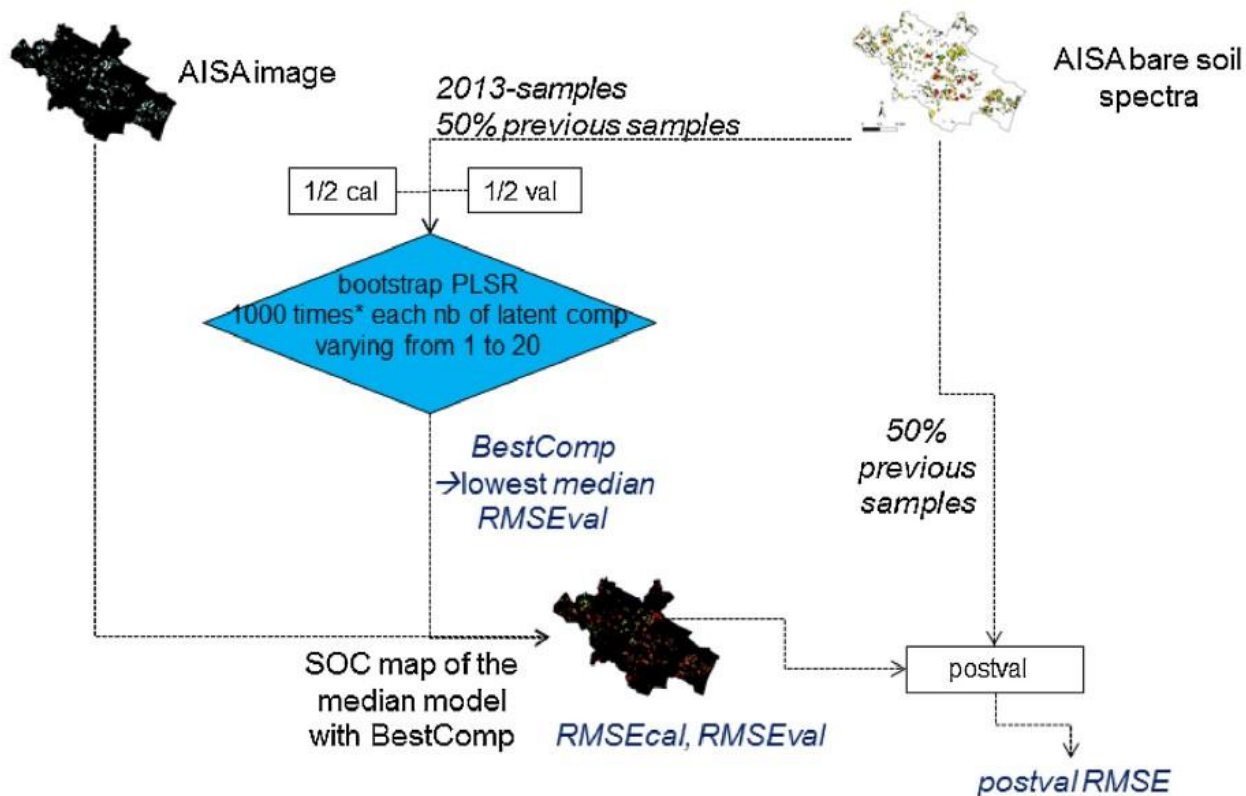


Fig. 3. Bootstrapped-PLSR SOC modeling approach (adapted from Vaudour et al., 2013).



Regional prediction of soil organic carbon content over temperate croplands using visible near-infrared airborne hyperspectral imaging and synchronous field spectra

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*Residual
prediction
deviation*

$$RPD = \frac{\sigma_y}{RMSE}$$

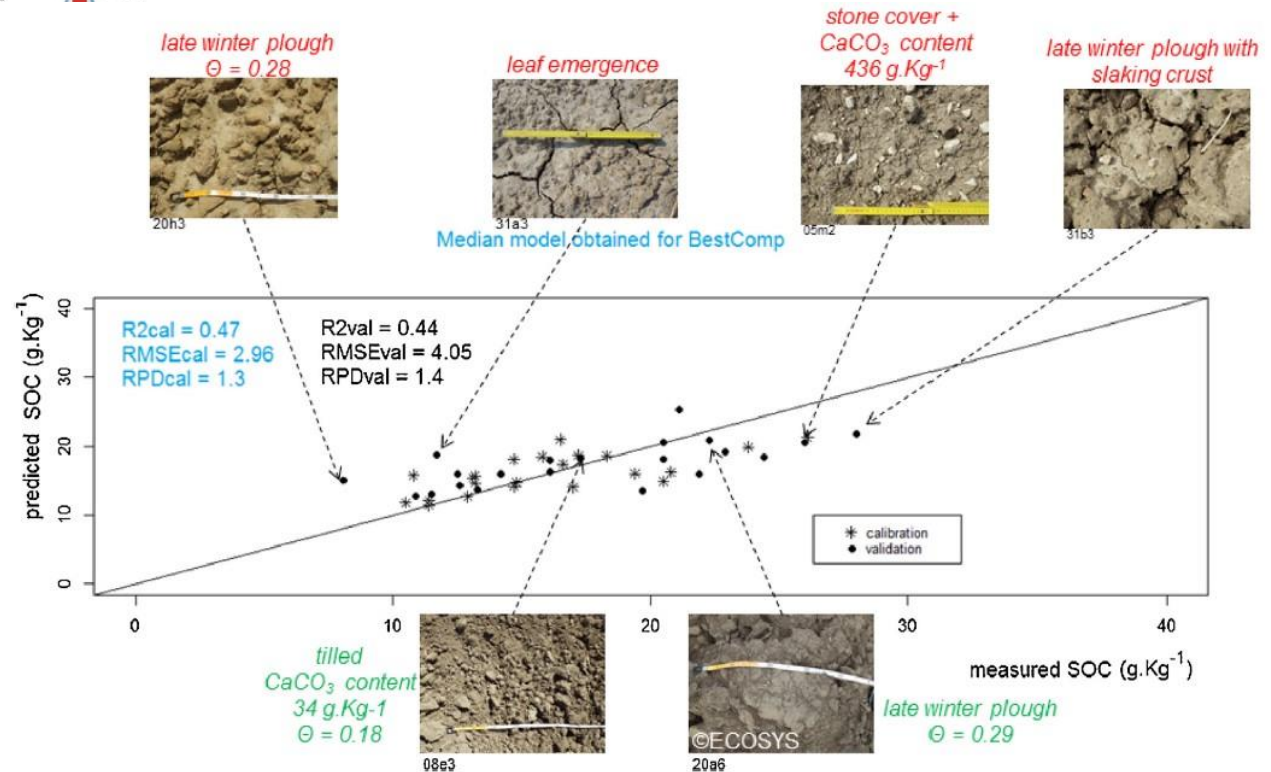
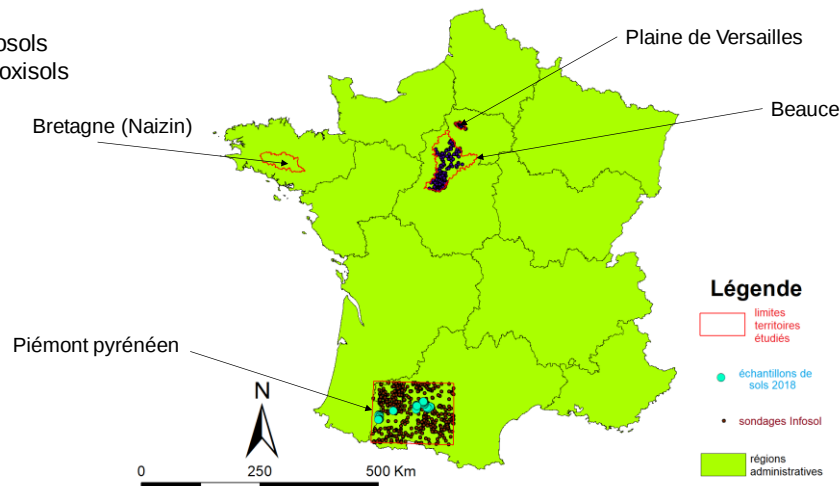
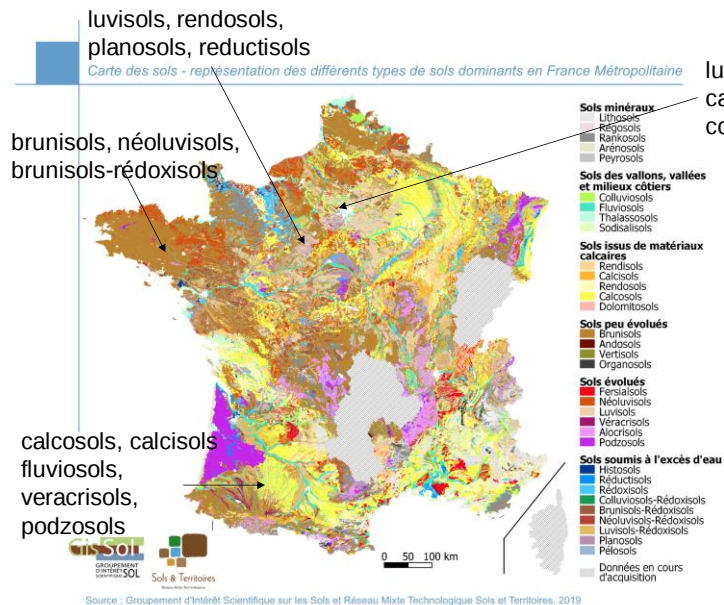


Fig. 7. Influence of soil surface condition.

Base de données sols projet POLYPHEME

- Types de sols très diversifiés sur des régions vastes et représentatives des principaux agroécosystèmes de grandes cultures tempérés (Bassin Parisien, Centre, Sud-Ouest, Bretagne)



URBINA-SALAZAR, thèse en cours
ZHAYANI, thèse en cours
DODIN, thèse en cours

STEROPES WP1

Task 1: **Collecting, selecting and structuring datasets**

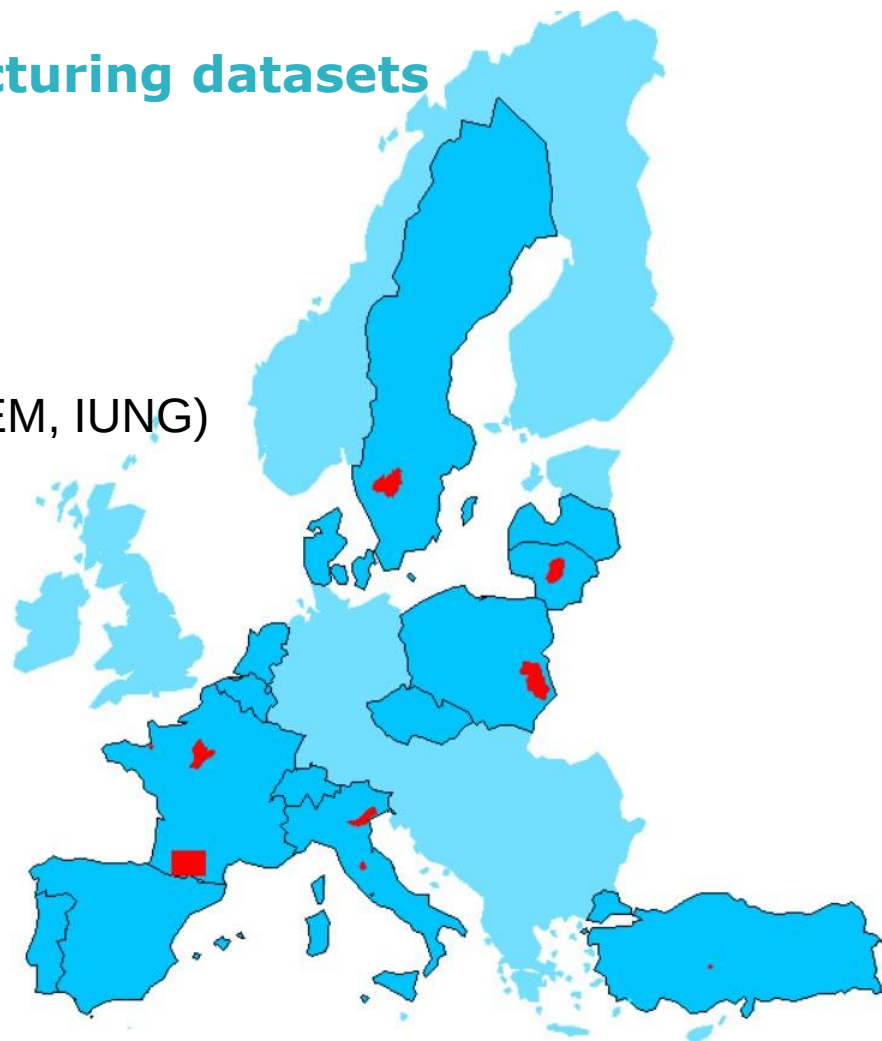
- **Summary for regional databases**

9 regional databases collected and structured

3 sampling surveys carried out (LAMMC, TAGEM, IUNG)

2 sampling surveys planned (LAMMC, INRAE)

5 databases processed or in progress





Regional prediction of soil organic carbon content over temperate croplands using visible near-infrared airborne hyperspectral imagery and synchronous field spectra



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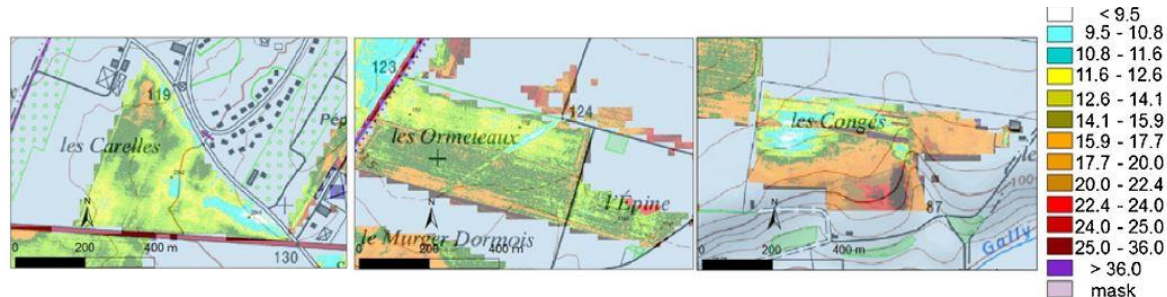
^c Université de Rennes 1/IRTR UMR CNRS 6164, ENSSAT/ITS2M, 6 rue de Kérampont, B.P. 80518, F-22305 Lannion cedex, France

Table 7

Expected error according to measurement method, scale and sensor (Vaudour et al., 2012, 2013; this study).

Scale	Whatever	Field	Field	Region	Region	Region	Region
Method	Dry combustion	Lab NIRS spectroscopy	Vis-NIR airborne image	Lab NIRS spectroscopy	Vis-NIR-SWIR field spectra	Vis-NIR airborne image	Vis-NIR -SWIR multispectral satellite image
Expected error (g kg ⁻¹)	0.4–0.6	0.80–0.95	3	3	4	4–4.5	4.6–5

prior to the
launching of
Sentinel-2



Vaudour et al., 2016

Fig. 10. Within-field variations in SOC predicted contents. In transparency, 1:25,000 topographical map Scan25®, Copyright French Geographical Institute (IGN).



Sentinel-2 image capacities to predict common topsoil properties

Vaudour et al., 2019a

Sentinel-2 image capacities to predict common topsoil properties of temperate and Mediterranean agroecosystems

E. Vaudour^{a,*}, C. Gomez^b, Y. Fouad^c, P. Lagacherie^b

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doi.org/10.1016/j.rse.2019.01.006

Temperate
soils



haptic
luvisols



rendzic,
calcareous
cambisols



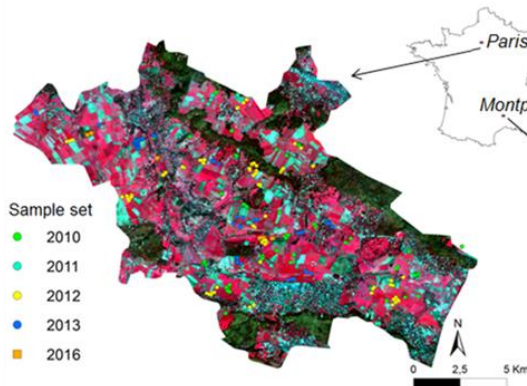
colluvic
cambisols



colluvic
cambisols
(stagnic)

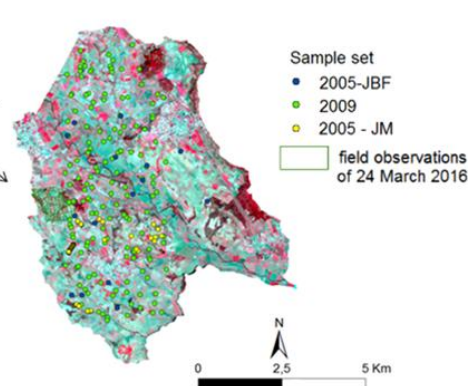
Crahet, 1992

Versailles Plain
Annual crops
221 km²



12/03/2016

Lower Payne valley
vineyards
48 km²



19/03/2016

Mediterranean
soils



colluvic
cambisols
(arenic)



chromic
luvisols



calcareous
leptosols



calcisols

Coulouma, 2008

PLSR leave-one-out cross-validation, 10 spectral bands with 10m/20m spatial resolution



Performances of Sentinel-2-derived spectral prediction models

Sentinel-2 image capacities to predict common topsoil properties of temperate and Mediterranean agroecosystems



E. Vaudour^{a,*}, C. Gomez^b, Y. Fouad^c, P. Lagacherie^b

^a UMR ECOSYS, AgroParisTech, INRA, Université Paris-Saclay, 78850, Thiverval-Grignon, France

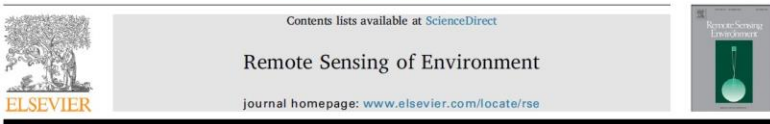
^b LISAH, Univ Montpellier, INRA, IRD, Montpellier SupAgro, Montpellier, France

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doi.org/10.1016/j.rse.2019.01.006

Performance group	R_{cv}^2	RPD_{cv}	Soil property Temperate agroecosystem (Versailles)	Soil property Mediterranean agroecosystem (Montpellier)
i) Intermediate to high	$\geq 0,5$	$\geq 1,4$	SOC , pH, CEC, $CaCO_3$	
ii) near-intermediate	0,4	1,3	clay	clay, Fe, CEC
iii) poor	$< 0,4$	~ 1	silt, sand	silt, sand, SOC , pH, $CaCO_3$

Vaudour et al., 2019a



Sentinel-2 image capacities to predict common topsoil properties of temperate and Mediterranean agroecosystems

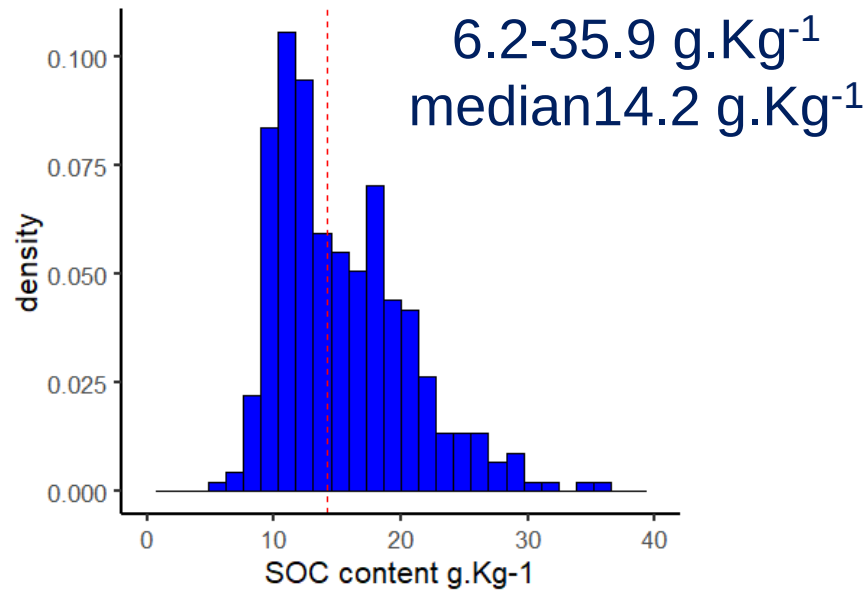
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^a UMR ECOSYS, AgroParisTech, INRA, Université Paris-Saclay, 78850, Thiverval-Grignon, France

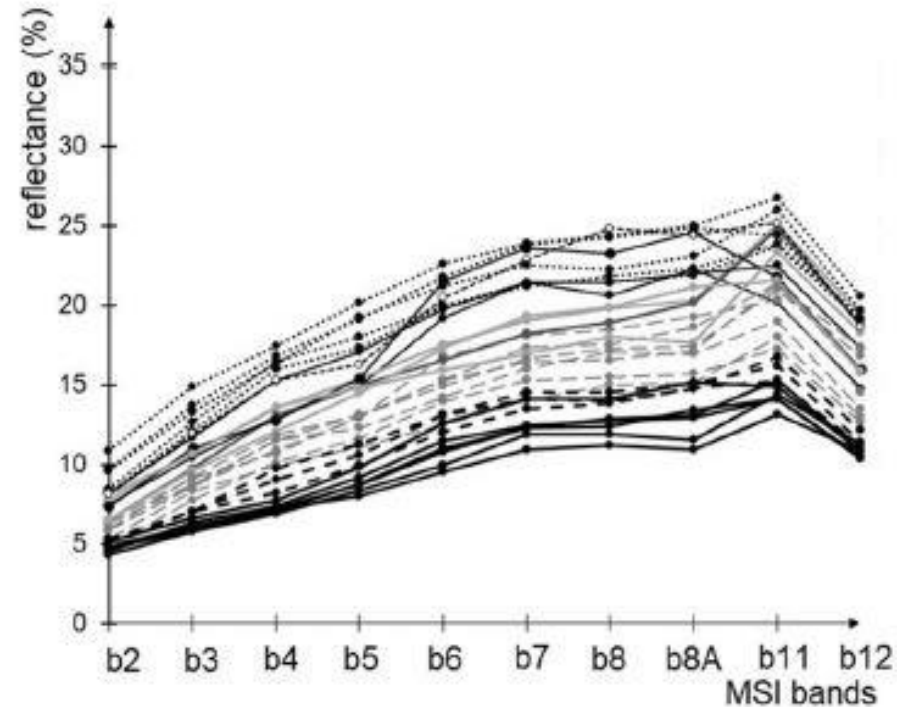
^b LISAH, Univ Montpellier, INRA, IRD, Montpellier SupAgro, Montpellier, France

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doi.org/10.1016/j.rse.2019.01.006



Sentinel-2 soil spectra



The Impact of Acquisition Date on the Prediction Performance of Topsoil Organic Carbon from Sentinel-2 for Croplands

Emmanuelle Vaudour ^{1,*}, Cécile Gomez ², Thomas Loiseau ³, Nicolas Baghdadi ⁴, Benjamin Loubet ¹, Dominique Arrouays ³, Leïla Ali ^{1,2} and Philippe Lagacherie ²

doi.org/10.3390/rs11182143

Impact of acquisition date

CrossVal PLSR	nb samples	RMSE _{CV} (g.Kg ⁻¹)	R ² _{CV}	RPD _{CV}	Performance group
12/03/16	83	4.78	0.16	1.1	poor
15/03/16	84	3.79	0.48	1.4	intermediate
14/04/16	86	5.05	0.003	1.0	poor
30/11/16	199	5.07	0.02	1.0	poor
27/12/16	173	4.82	0.26	1.2	poor
27/03/17	147	4.45	0.33	1.2	poor
30/03/17	144	4.68	0.29	1.2	poor
09/04/17	125	3.38	0.46	1.4	intermediate
19/04/17	122	3.02	0.58	1.5	intermediate

Influence of soil surface roughness

Article

The Impact of Acquisition Date on the Prediction Performance of Topsoil Organic Carbon from Sentinel-2 for Croplands

Emmanuelle Vaudour ^{1,*}, Cécile Gomez ², Thomas Loiseau ³, Nicolas Baghdadi ⁴, Benjamin Loubet ¹, Dominique Arrouays ³, Leïla Ali ^{1,2} and Philippe Lagacherie ²

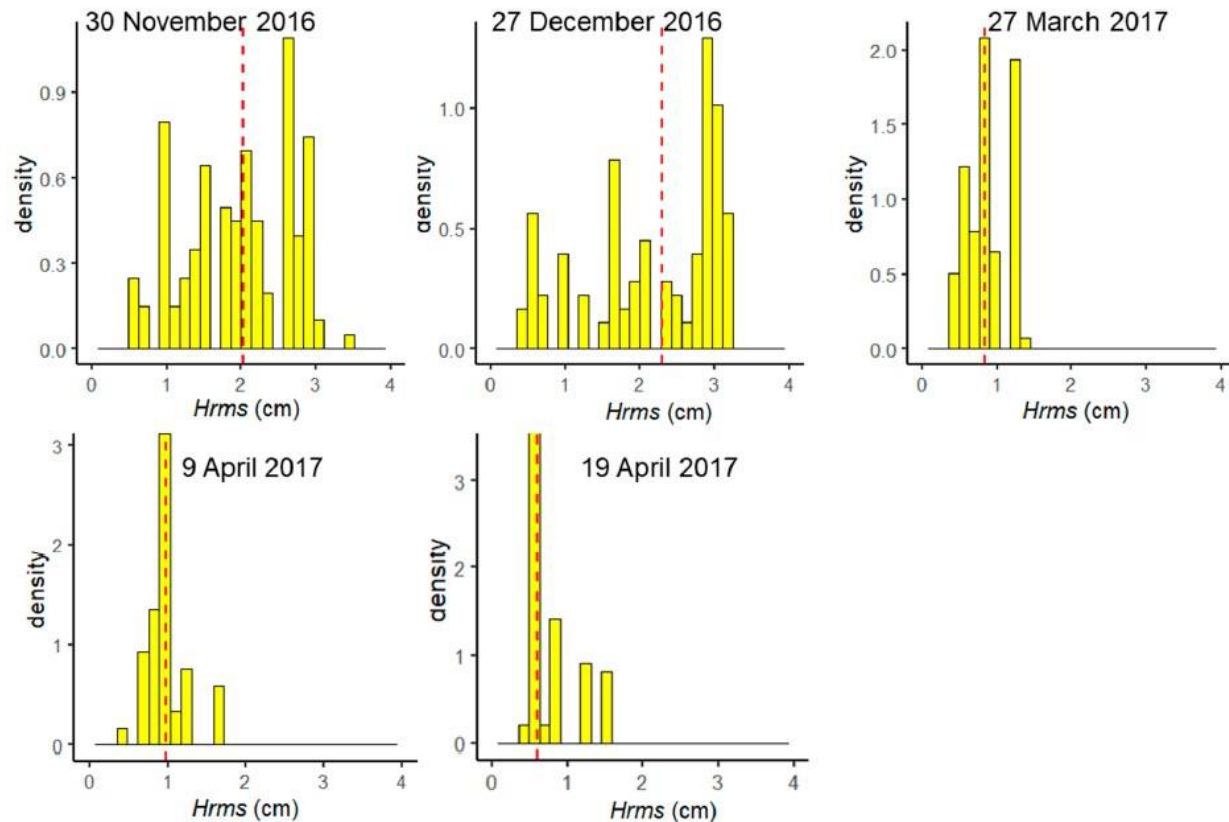
doi.org/10.3390/rs11182143

Article

Potential of Sentinel-1 Images for Estimating the Soil Roughness over Bare Agricultural Soils

Nicolas Baghdadi ^{1,*}, Mohammad El Hajj ¹, Mohammad Choker ¹, Mehrez Zribi ², Hassan Bazzi ¹, Emmanuelle Vaudour ³, Jean-Marc Gilliot ³ and Dav M. Ebengo ³

doi:10.3390/w10020131



Using Sentinel-2 Images for Soil Organic Carbon Content Mapping in Croplands of Southwestern France. The Usefulness of Sentinel-1/2 Derived Moisture Maps and Mismatches between Sentinel Images and Sampling Dates

Diego Urbina-Salazar ^{1,2}, Emmanuelle Vaudour ^{1,*}, Nicolas Baghdadi ³, Eric Ceschia ⁴, Anne C. Richer-de-Forges ², Sébastien Lehmann ² and Dominique Arrouays ²

doi:10.3390/rs13245115

Soilscape units well captured

Urbina-Salazar et al, 2021

- ✓ RMSEcv~6g.kg⁻¹, RPD~1.7-1.8
- ✓ pas d'amélioration avec %vol SMP comme covariable mais facilitation choix dates
- ✓ adéquation avec unités morphologiques (veracrisols)

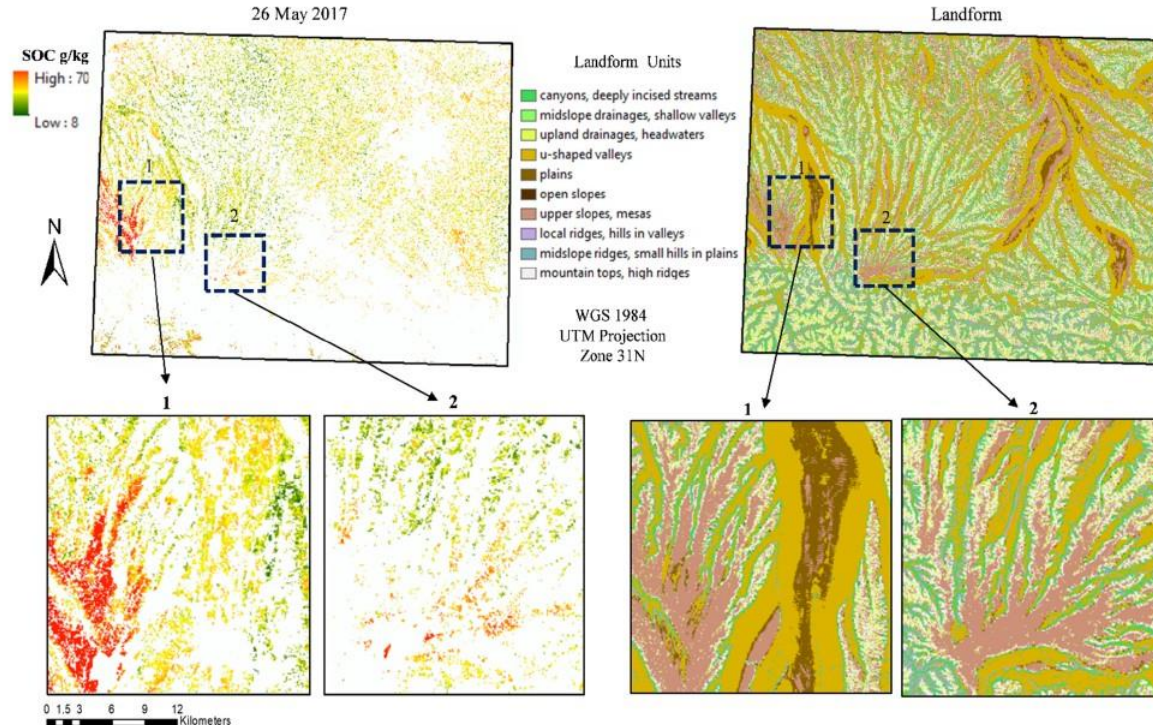
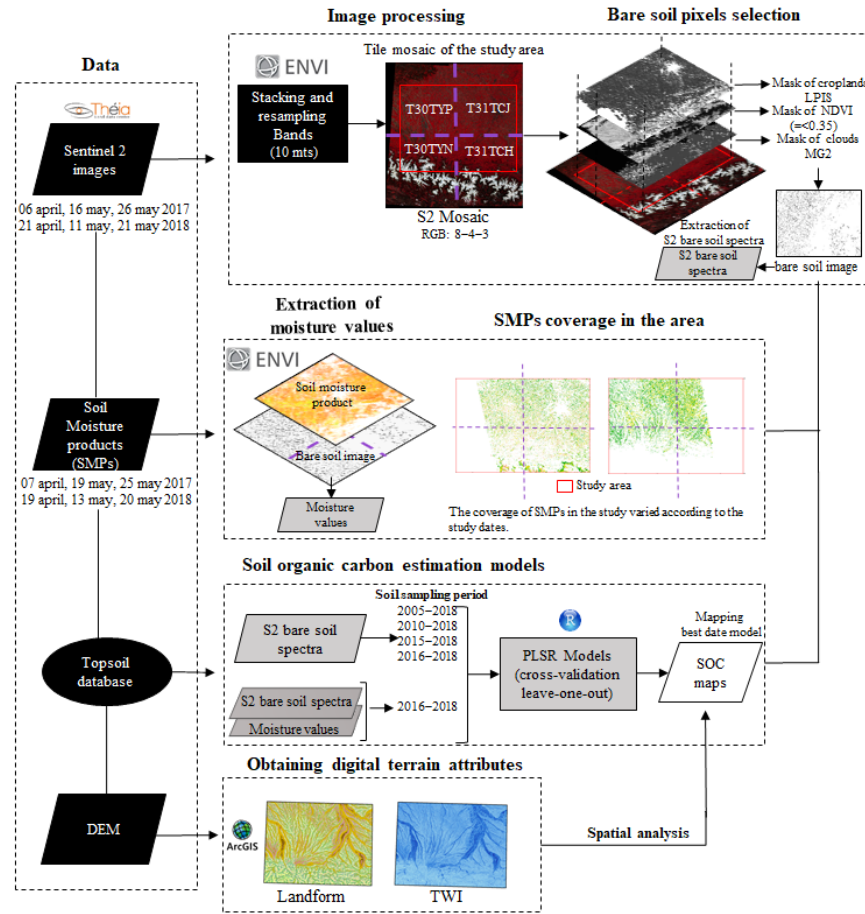


Figure 7. Zooming into the SOC map and the landforms of the study area.

Using Sentinel-2 Images for Soil Organic Carbon Content Mapping in Croplands of Southwestern France. The Usefulness of Sentinel-1/2 Derived Moisture Maps and Mismatches between Sentinel Images and Sampling Dates

Diego Urbina-Salazar ^{1,2}, Emmanuelle Vaudour ^{1,*}, Nicolas Baghdadi ³, Eric Ceschia ⁴, Anne C. Richer-de-Forges ², Sébastien Lehmann ² and Dominique Arrouays ²

doi:10.3390/rs13245115



Need to handle several tiles and soil datasets – best results with matching data

- ✓ 4 tiles;
- ✓ varied soil datasets including LUCAS;

Urbina-Salazar et al, 2021



Sentinel-2 image capacities to predict common topsoil properties of temperate and Mediterranean agroecosystems

E. Vaudour^{a,*}, C. Gomez^b, Y. Fouad^c, P. Lagacherie^b

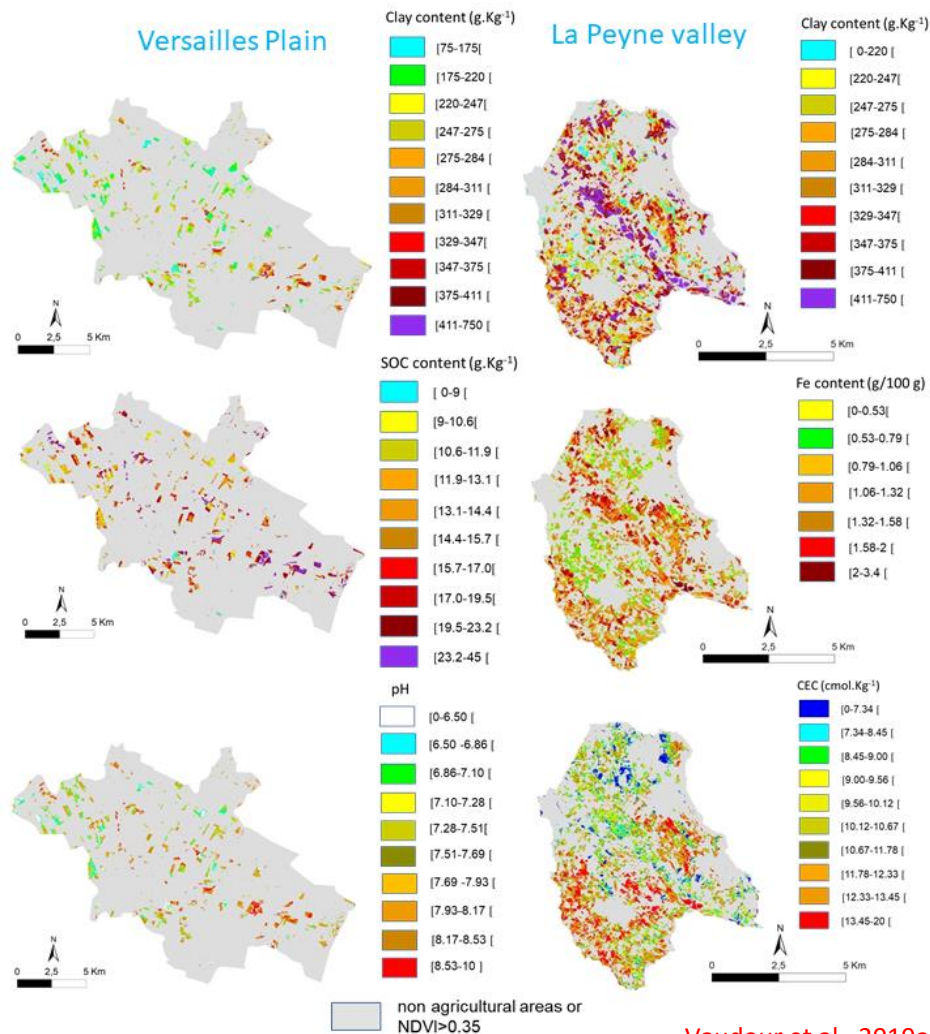
^a UMR ECOSYS, Agroparistech, INRA, Université Paris-Saclay, 78850, Thiverval-Grignon, France

^b LISAH, Univ Montpellier, INRA, IRD, Montpellier SupAgro, Montpellier, France

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doi.org/10.1016/j.rse.2019.01.006

Maps derived from Sentinel-2



Bare soil extent varies with date

Vaudour et al., 2021

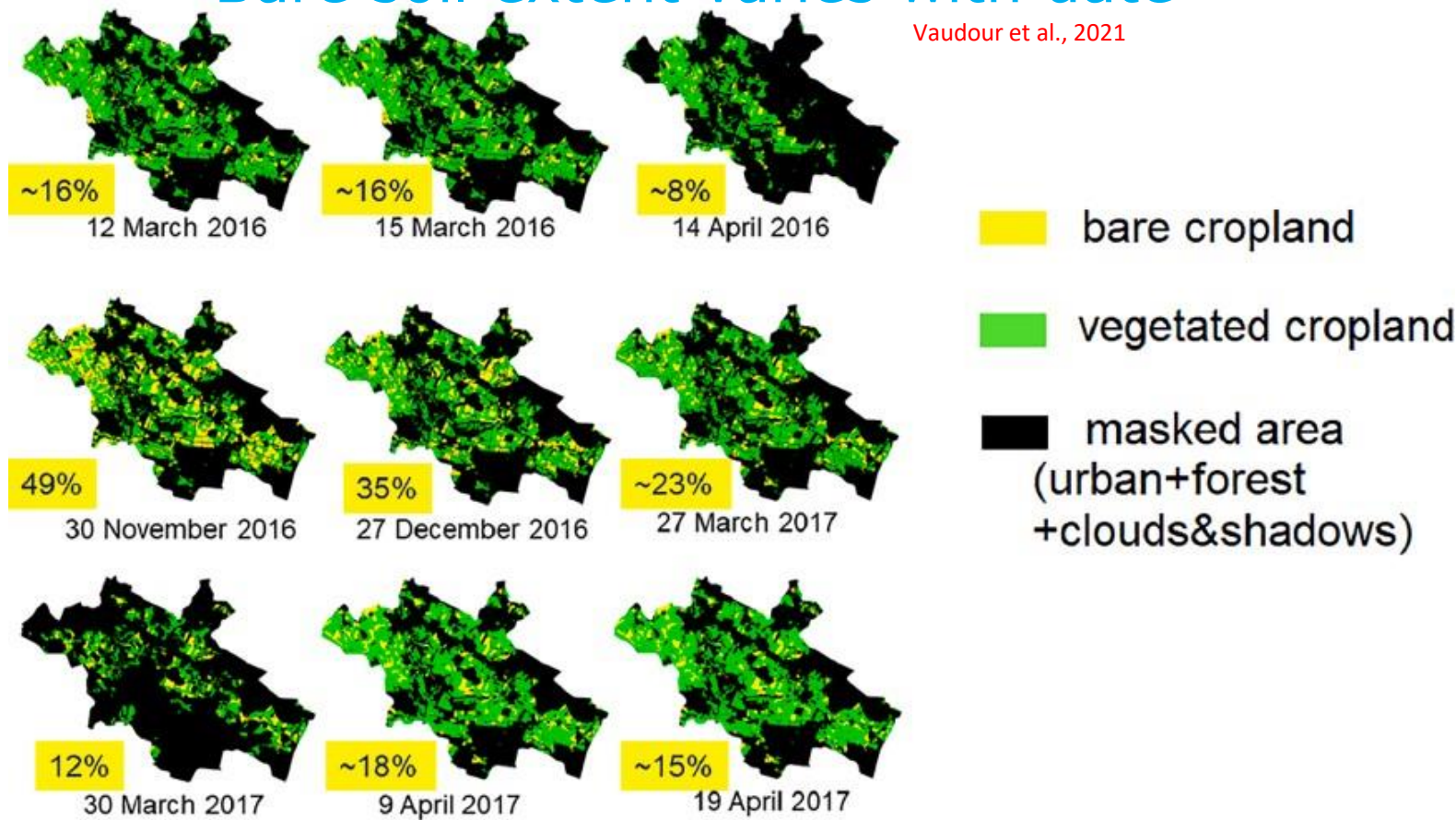


Fig. 4. Map of the percentage of bare soil coverage for the agricultural area according to acquisition date ($NDVI \leq 0.35$).

Temporal mosaicking approaches of Sentinel-2 images for extending topsoil organic carbon content mapping in croplands

Emmanuelle Vaudour^{a,*}, Cécile Gomez^{b,c}, Philippe Lagacherie^b, Thomas Loiseau^a, Nicolas Baghdadi^e, Diego Urbina-Salazar^a, Benjamin Loubet^a, Dominique Arrouays^d
doi.org/10.1016/j.jag.2020.102277



Temporal mosaicking approaches of Sentinel-2 images for extending topsoil organic carbon content mapping in croplands

Emmanuelle Vaudour^{a,*}, Cécile Gomez^{b,c}, Philippe Lagacherie^b, Thomas Loiseau^d,
Nicolas Baghdadi^e, Diego Urbina-Salazar^a, Benjamin Loubet^a, Dominique Arrouays^d

doi.org/10.1016/j.ijag.2020.102277

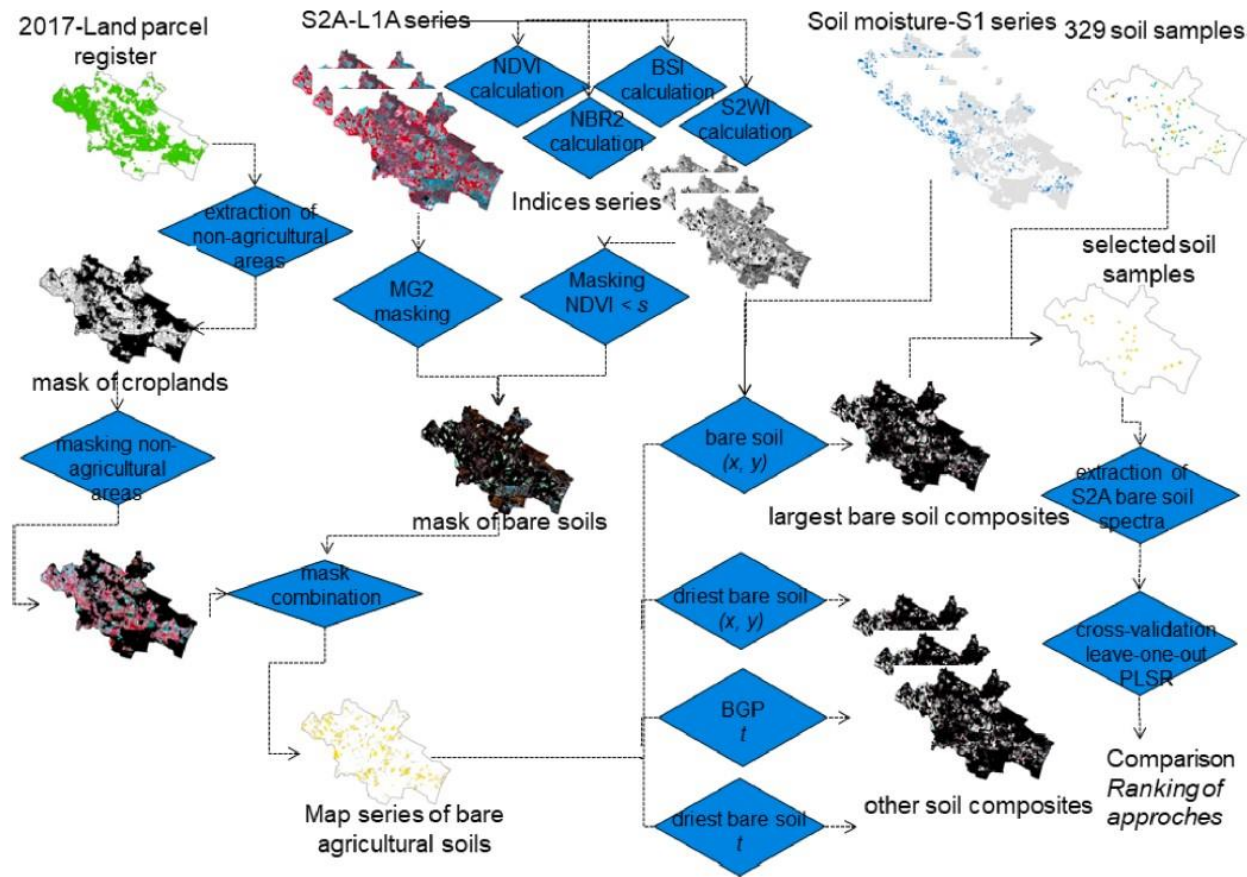


Fig. 3. General flowchart for the mosaicking approach (s = NDVI threshold of either 0.27 or 0.35; BGP = best global performance).

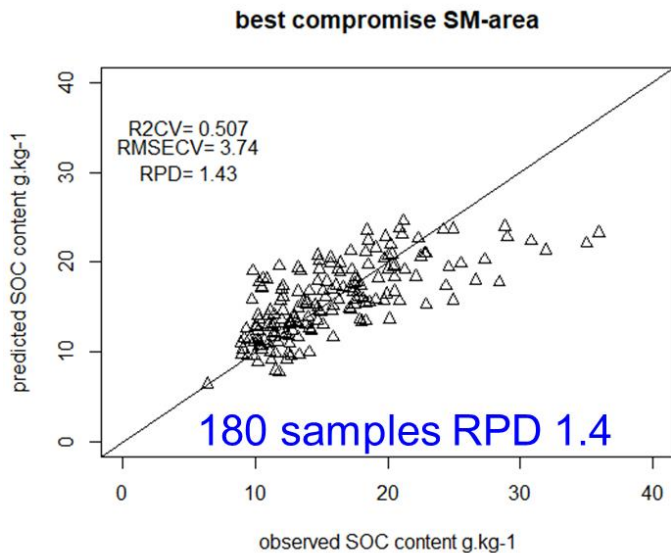


Temporal mosaicking approaches of Sentinel-2 images for extending topsoil organic carbon content mapping in croplands

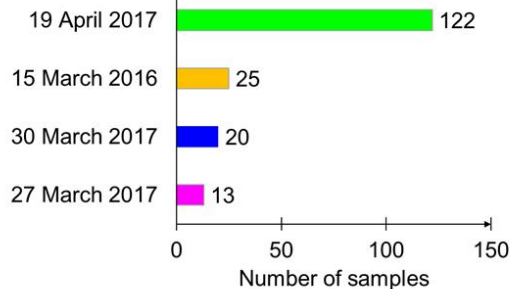
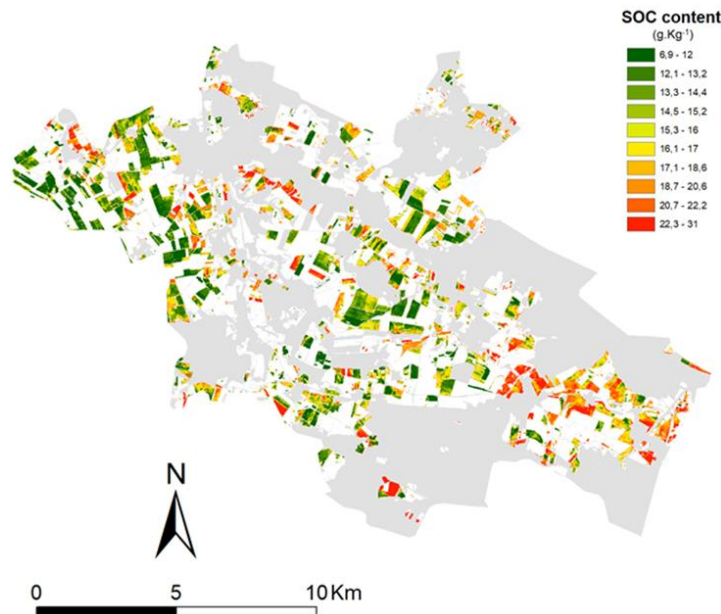
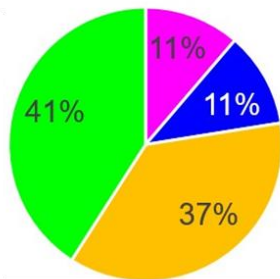
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Best strategy relies on mean SM+max areal coverage



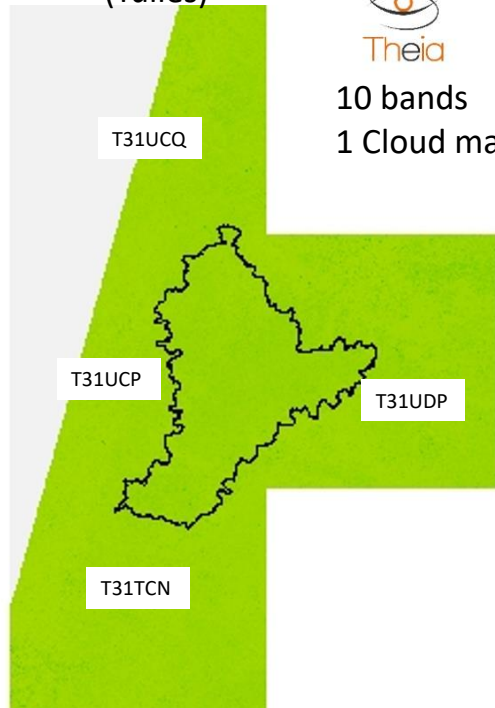
areal
distribution



agricultural
area predicted
*2,44
compared to
best single
date

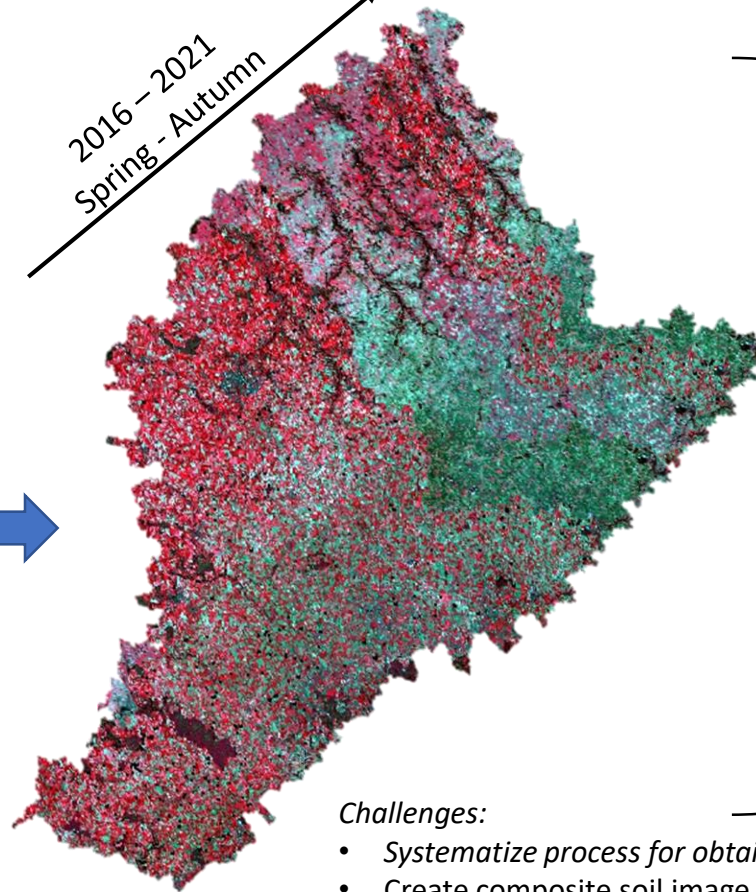
Beauce (in progress)

Area coverage
(Tuiles)



10 bands
1 Cloud mask

2016 – 2021
Spring – Autumn



73 single dates
Approx 500 GB

Challenges:

- *Systematize process for obtaining and processing images*
- Create composite soil image to maximize area and use the sample data available.
- To determine if the use of S2 to predict SOC is useful for this area with different soil, landforms and climatic conditions.

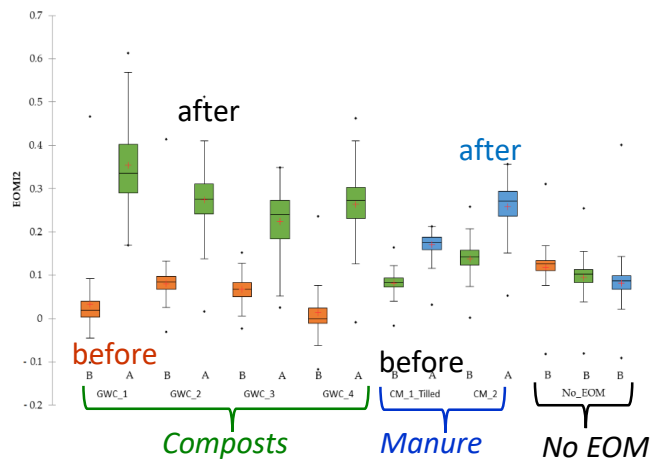
URBINA-SALAZAR, thèse en cours

Potential of Sentinel-2 Satellite Images for Monitoring Green Waste Compost and Manure Amendments in Temperate Cropland

Maxence Dodin ¹, Hunter D. Smith ^{1,2}, Florent Levavasseur ¹, Dalila Hadjar ¹, Sabine Houot ¹ and Emmanuelle Vaudour ^{1,*}  doi:10.3390/rs13091616

S2 spectra detect compost and manure

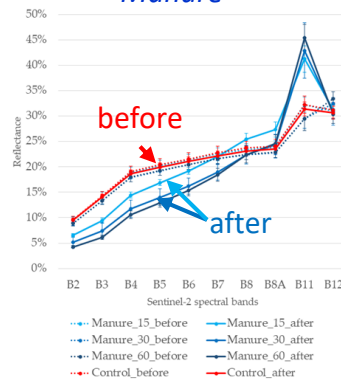
EOMI2 index from S2-spectra



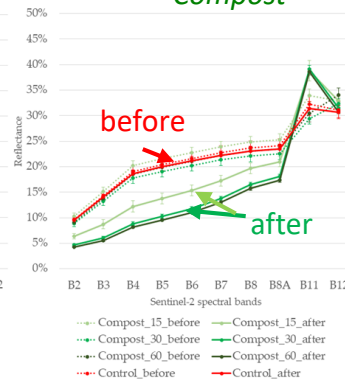
Simulated S2- field spectra



Manure

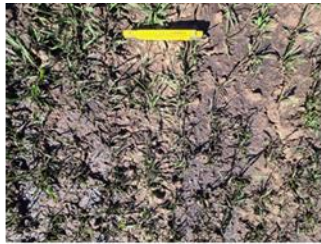


Compost

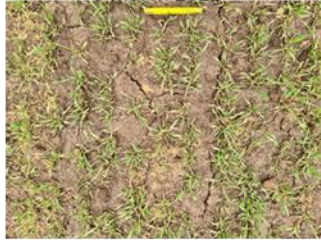


Dodin et al., 2021

Field spectroscopy over INRAE-Nouzilly experiment



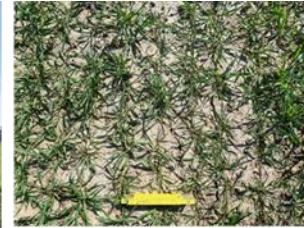
9 March 2022



16 March 2022



Digestate derived from methanization – 1 day after spreading

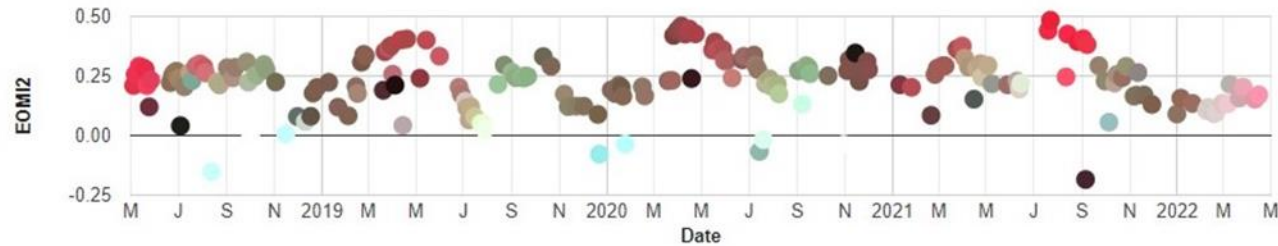


9 March 2022



16 March 2022

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DODIN, thèse en cours

Conclusion générale

- ❖ résultats encourageants avec Sentinel-2
- ❖ extrapolations à divers agroecosystèmes and types de sols ;
synergie de plusieurs projets en cours échelons
national/européen
- ❖ utilisation accrue de données spatio-temporelles
- ❖ besoin de développements méthodologiques : projet en
construction



Vaudour E., 2017 - <https://imaggeo.egu.eu/view/12252>